

Intercomparison of monthly Euro-Atlantic weather regimes obtained from different reanalysis and of their influence on wind energy resources

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1. Background and goals

- Synoptic climatology investigates atmospheric variability by classifying the complex dynamics of large-scale circulation in a few recurrent and persistent patterns, called "circulation regimes" or "weather regimes" (Michelangeli et al., 1995; Hannachi et al., 2017).
- The aim of this study is to compare the differences between the weather regimes as classified by three different modern reanalysis: JRA-55 (Kobayashi et al. 2015), ERA-Interim (Dee et al., 2011) and NCEP-NCAR (Kalnay et al., 1996).

2. Data and methodology

- Daily-means of **SLP and 10-m wind speed** fields were employed. Each of the three chosen dataset has a different spatial resolution: 1.25° (JRA-55), 0.75° (ERA-Interim) or 2.5° (NCEP). SLP data was preferred to geopotential height, even if it is noisier, because it doesn't show any temporal trend (Hafez and Almazroui, 2014).
- To classify the regimes, a **k-means cluster analysis with $N=4$ clusters** was applied to the data of each month separately, as four is the preferred number of regimes in the Euro-Atlantic region [26.9°N-80.5°N, 85.6°W-45.6°E] (Yiou and Nogaj, 2004).
- Regime anomalies were measured by averaging the daily SLP anomalies belonging to each regime and month during 1981-2016. The **influence of each regime on 10-m wind speed** was measured by averaging daily 10-m wind speed anomalies belonging to each regime and month separately for JRA-55.
- To be able to compare the regime anomalies with the pattern correlation, JRA-55 and ERA-Interim were regridded to the same grid of NCEP (horiz.res. 2.5°) with a bilinear interpolation.

3.1. Results: regime anomalies and frequencies

- Figure 1 illustrates the spatial patterns of the monthly regime anomalies of the four regimes for **JRA-55 reanalysis**, ordered (from left to right) by **decreasing average frequency** of occurrence during 1981-2016. They often resemble the spatial patterns of the **NAO+, NAO-, blocking** or **Atlantic ridge** wintertime regimes (Salameh et al., 2008). Regime anomalies are globally stronger from October to March and weaker from April to September.
- Monthly frequencies vary from a maximum of 34.5% of Regime #1 in August to a minimum of 18.3% of regime #4 in the same month.

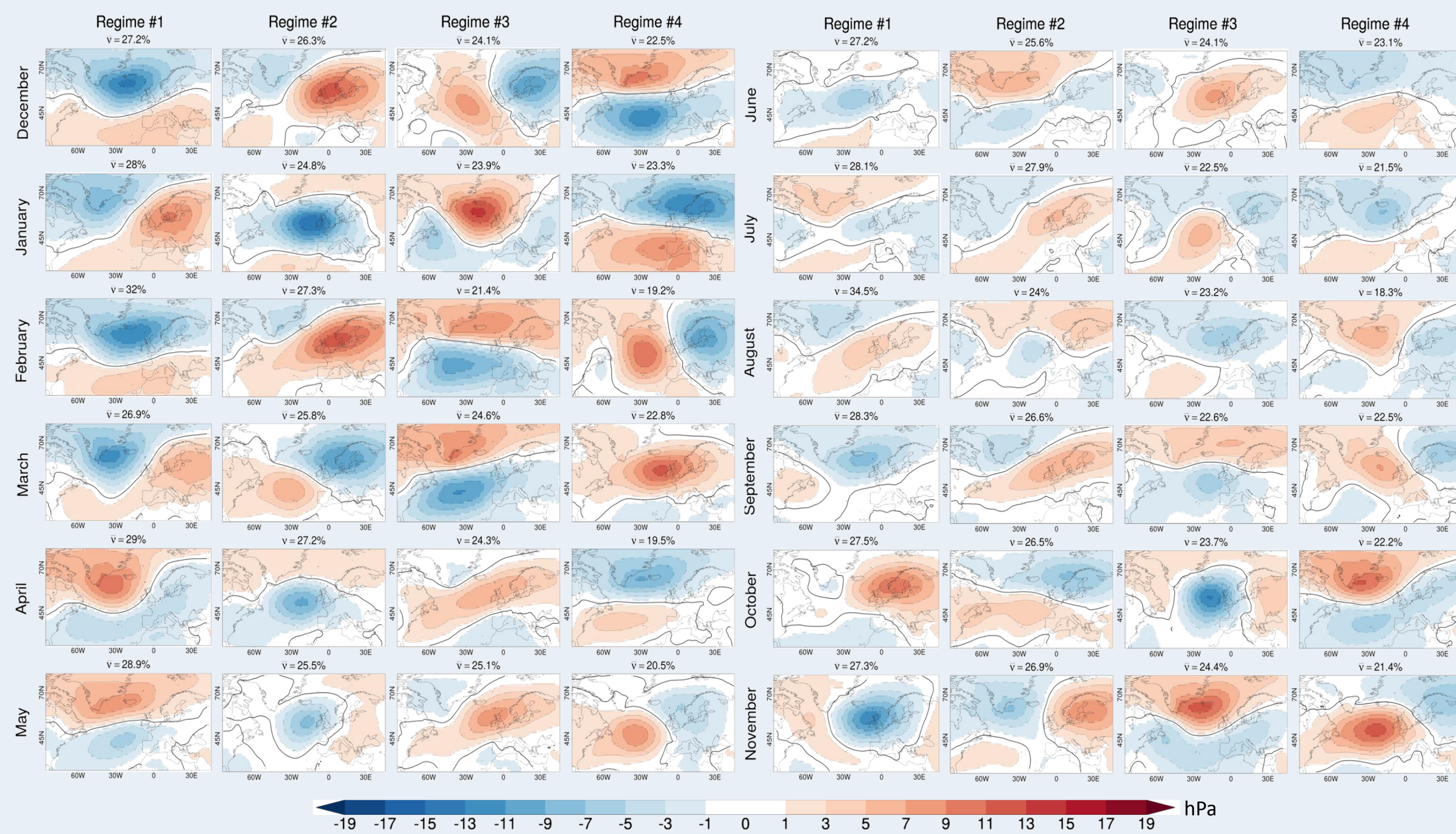


Figure 1. Spatial anomalies (hPa) of the four monthly regimes from December (top left row) to November (bottom right row) as classified for the **JRA-55** reanalysis. Regimes are shown, from left to right, in decreasing order of average monthly frequency (1981-2016). **Black lines** separate regions with positive and neg.anomalies.

- Comparison between JRA-55, ERA-Interim and NCEP revealed that they present almost identical spatial patterns, with **pattern correlations** between correspondent regimes of different reanalysis **always significant at 99% level of confidence, and higher than $r=0.95$ in all months except August**.
- In August, pattern correlations** between the regimes #4 of JRA-55 and ERA-Interim and between JRA-55 and NCEP **drop to $r=0.85$** for both pairs of regimes.
- The **average frequencies of occurrence** (1981-2016) of the regimes can vary slightly between the three reanalysis, but usually within $\pm 1\%$. Differences higher than 1% are measured for regime #1 and #4 in **August** (JRA-55 av. frequency respectively higher or lower than $\sim 4\%$ compared to the other reanalysis) and for regime #2 and #4 in **December**, when NCEP freq. can be 2% lower than the other reanalysis (not shown).
- Lowest correlations between the **time series of the monthly frequencies** of pair of correspondent regimes from different reanalysis (i.e: the August time series in Figure 2) were detected during **July** ($r_{JRA55-NCEP} = 0.88$), **August** ($r_{JRA55-ERAInt} = 0.85$) and **December** ($r_{ERAInt-NCEP} = 0.92$). Correlations for all other months are always greater than $r=0.95$.

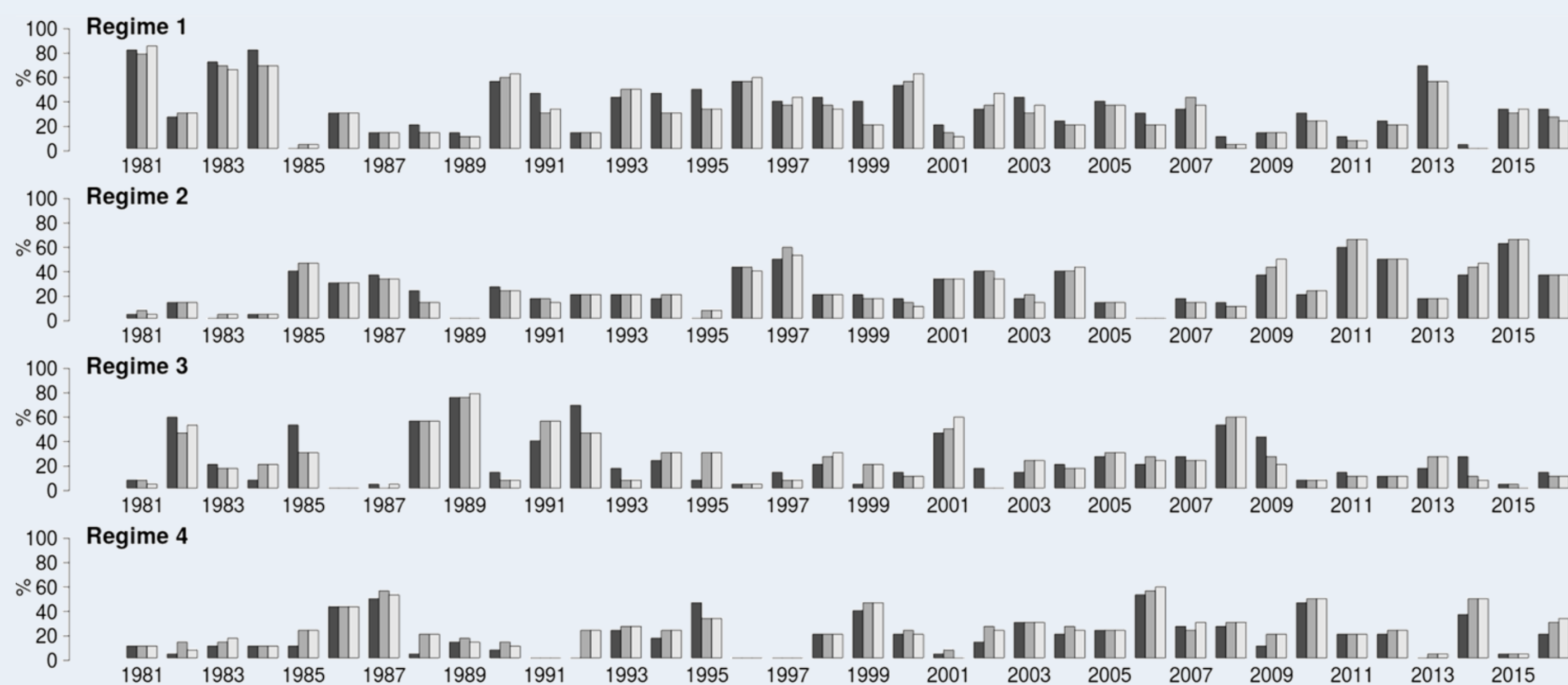


Figure 2. August monthly frequency time series from 1981 to 2016 of the four regimes (top to bottom) as measured by JRA-55 (black columns), by ERA-Interim (gray columns) and by NCEP (white columns).

3.2. Results: influence on wind speed

- Figure 3 shows the influence of each regime on monthly 10-m wind speed. For example, the red or blue influence areas shown for Regime #1 in December illustrates **where wind speed is higher or lower than average** during a **NAO+** episode (cfr. Figure 3 and Figure 1).
- Regimes have a **high influence in western and northern Europe and during winter months** and a low influence in the Mediterranean basin, eastern Europe and in summer months.

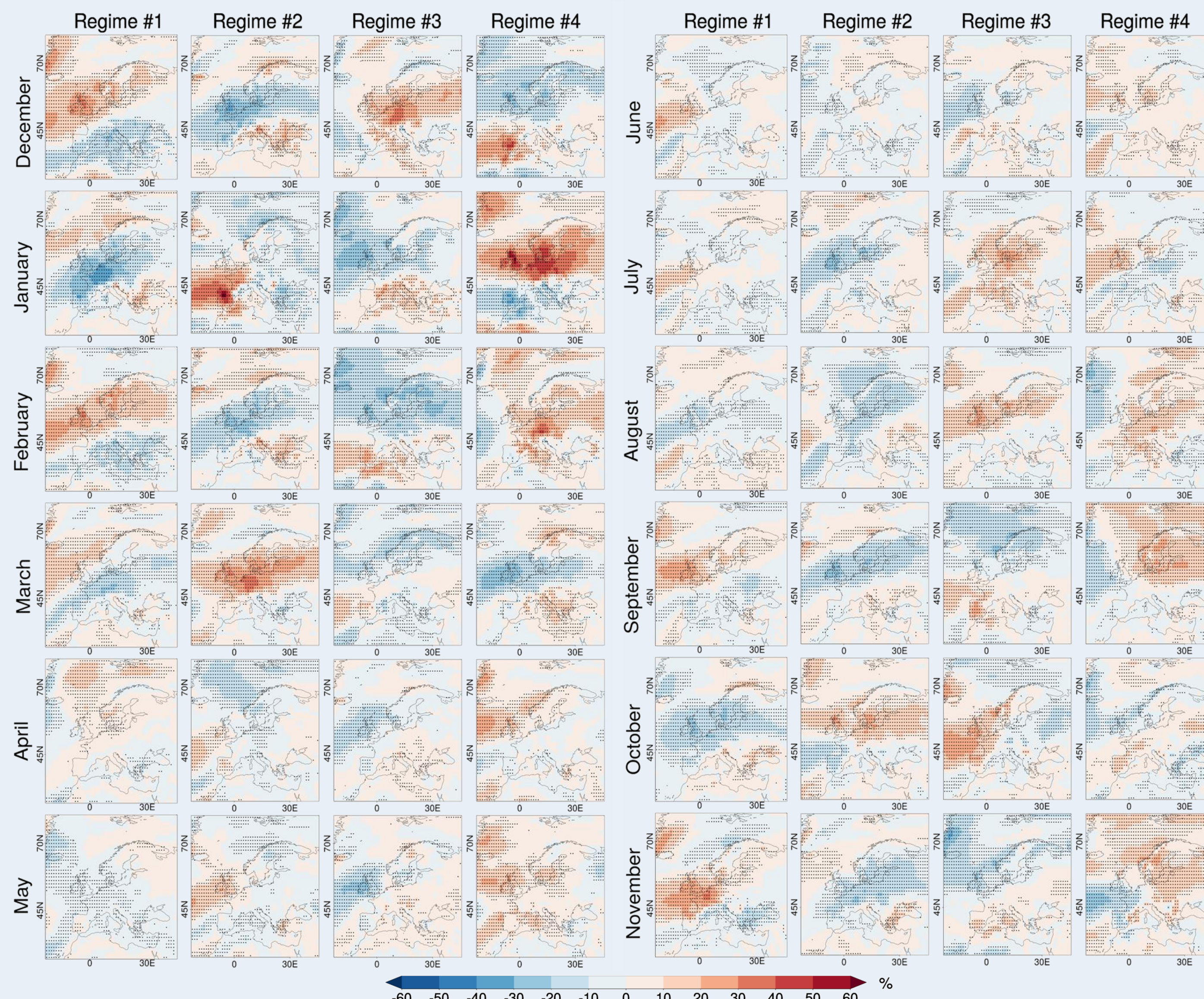


Figure 3. Average daily European 10-m wind speed anomalies belonging to each month (1981-2016) and regime for JRA-55 reanalysis, from December (top left row) to November (bottom right row). Wind anomalies (in m/s) were normalized for the mean climatological value at each point to obtain relative anomalies (in %). Black dots show areas with significant anomalies with a t-test at 95% confidence level.

- Each reanalysis reproduces the spatial patterns in Figure 3 in a slightly different way. To measure the disagreement, pattern correlations between 10-m wind speed spatial anomalies for a given regime and month were measured for each pair of correspondent regimes belonging to two different reanalyses (Table 1).

Table 1. Pattern correlations between 10-m wind speed anomalies for a given month and regime and two different reanalysis. Only correlations below $r=0.95$ are shown. Yellow values represent correlations between 0.80-0.90 and red values are correlations lower than 0.80. Italic numbers represent not significant correlations at 95% confidence level.

	$r_{(JRA55-ERA)}$				$r_{(JRA55-NCEP)}$				$r_{(ERA1-NCEP)}$			
Month	WR1	WR2	WR3	WR4	WR1	WR2	WR3	WR4	WR1	WR2	WR3	WR4
Jan					0.92	0.93	0.87	0.89	0.93	0.90	0.90	0.94
Feb					0.88	0.85	0.91	0.90	0.88	0.91	0.92	0.90
Mar					0.85	0.89	0.89	0.92	0.93	0.88	0.90	0.90
Apr					0.86	0.90	0.90	0.83	0.86	0.91	0.87	0.92
May					0.84	0.89	0.85	0.89	0.88	0.90	0.90	
Jun			0.94	0.93	0.86	0.89	0.87	0.82	0.91	0.82	0.87	0.88
Jul				0.88	0.88	0.79	0.86	0.75	0.76	0.91	0.82	0.84
Aug	0.90	0.94	0.82	0.91	0.82	0.87	0.77	0.83	0.89	0.91	0.88	0.88
Sep					0.91	0.84	0.88	0.89	0.87		0.85	0.91
Oct	0.86				0.85	0.94	0.90	0.88	0.91		0.86	0.90
Nov					0.91	0.84	0.88	0.89	0.86	0.91	0.89	0.91
Dec					0.91	0.89	0.89	0.86	0.91	0.92	0.90	0.87

- Overall, **pattern correlations are lower than in section 3.1**, mainly because two variables are employed to measure wind anomalies for each regime: SLP (to classify regimes) and 10-m wind speed.
- Lowest correlations were measured in July** ($r=0.75$) followed by August ($r=0.77$) and more generally for the whole JRA55-NCEP pair (central columns in Table 1).
- Correlations between JRA-55 and ERA-Interim are systematically higher than between JRA-55 and NCEP, or ERA-Interim and NCEP (four left columns in Table 1). Thus, **wind speed regime anomalies measured by NCEP are the more different ones of the three reanalysis**.

4. Conclusions

- Very small differences** were measured when comparing both spatial patterns and the frequencies of the regimes classified by the three chosen reanalysis, as **correlations were generally greater than $r=0.95$** . This indicates that SLP is a consistent variable among the reanalyses.
- Higher differences** were detected when comparing wind speed regime anomalies, particularly the ones proceeding from NCEP, for which **pattern correlation decreases to $r=0.75$ in July**.

5. References

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